



University of
Pittsburgh

Algorithms and Data Structures 2

CS 1501



Spring 2023
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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides)

Contact Info

- **Course website:** <http://www.cs.pitt.edu/~skhattab/cs1501/>
- **Instructor:** Sherif Khattab ksm73@pitt.edu
- **My Student Support Hours:** <https://khattab.youcanbook.me>
 - MW: 10:00-11:00; Th: 9:00-10:00 and 11:00-12:00; F by appointment
 - 6307 Sennott Square, Virtual Office: <https://pitt.zoom.us/my/khattab>
 - Please schedule at: <https://khattab.youcanbook.me/>
- **Communication**

Piazza (**Please expect a response within 72 hours**)

Email not recommended!

Recitation Info

- **Teaching Team:**
 - Connor Sweeney, cps43@pitt.edu
 - Winston Osei-Bunso, wio6@pitt.edu
 - Thomas Brusilovsky, tpb22@pitt.edu
 - Taha Ayyaz Ahmad, taa95@pitt.edu
 - One more TA to be added
- **No recitations this week, but you got some work to do!**
 - Check Lab 0 on Canvas

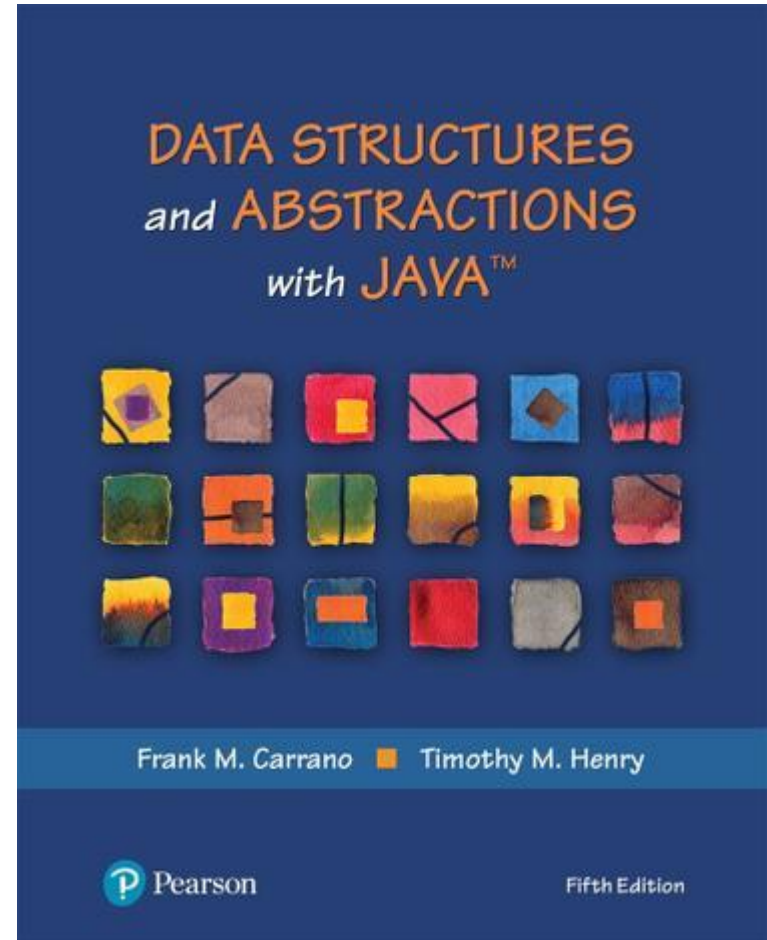
Textbooks



Algorithms (4th Edition)

Robert Sedgwick and Kevin Wayne

Online Resources: <https://algs4.cs.princeton.edu/>



Data Structures and Abstractions with Java (5th Edition)

Frank M. Carrano and Timothy M. Henry

Grades

- 40% on best four out of five **programming assignments**; mostly autograded
 - posted on Canvas, distributed using Github, and submitted on **Gradescope** from Github
- 30% on **exams**: 18% on higher grade and 12% on lower
- 10% on **homework assignments** on Gradescope
- 10% on **lab exercises**; mostly autograded
- 10% on in-class **Top Hat** questions

Canvas Walkthrough

- Lectures posted on Tophat
 - Draft PDF slides available on Github before class
- Lecture and recitation recordings
 - under **Panopto Video**
- **RedShelf** Inclusive Access for the Sedgewick Textbook
 - You can cancel and get a refund before Add/Drop
- **Piazza for discussion and communication**
- **Gradescope** and autograding policies
- Academic Integrity
- NameCoach

Expectations

- Your continuous feedback is important!
 - Anonymous Qualtrics survey
 - Midterm and Final OMET
- Your engagement is valued and expected with
 - classmates
 - teaching team
 - material

Lecture structure (mostly)

Time	Description
~5 min before and after class	Informal chat
~25 min	Announcements, review of muddiest points on previous lecture, and QA on assignments/labs/homework problems
~45 min	Lecturing with Tophat questions and/or activities
~5 minutes	QA and muddiest points/reflections

Why is this class (notoriously) hard?

- **Lots of concepts**
 - Attend lectures and recitations (if you absolutely cannot attend, watch the video recordings)
 - Study often!
 - Put effort into the weekly homework assignments
- **Programming Assignments are relatively hard**
 - Refresh your Java programming (CS 0445) and **debugging skills**
 - Start early and show up to student support hours!

Goals of the course

- To convert non-trivial *algorithms* and *data structures* into *programs*
 - Various issues will always pop-up during *implementation*
 - Such as?...
- To *analyze* algorithms and how they affect the *run-times* of the associated programs
 - Different solutions can be compared using many metrics

Announcements

- Lab 0 is due this Friday (not graded)
- Recitations start next week
- Homework 1 will be assigned this Friday
- JDB Example and VS Code Debugging Video will be available on Canvas
- Draft slides and handouts available on Canvas

Today's Agenda

- A technique for modeling runtime of algorithms
 - $\sum_{all\ statements} Cost * frequency$
- Determining the order of growth of a function
 - Ignoring lower-order terms and multiplicative constants
 - The Big O family

Let's consider the ThreeSum problem

- 3-sum Problem
 - Given a set of arbitrary integers find out how many **distinct** triples sum to exactly zero
 - do you have questions on the problem specification?
- Example input:
 - 5, -1, 2, -3, -2, 1, 0
 - what should the output be?

Brute-force solution

Enumerate all possible distinct triples and check their sums

cnt = 0

for each distinct triple

if sum of triple equals zero

increment cnt

- How would you enumerate all distinct triples?
- What if all the input integers are unique?

Brute-force solution

```
public static int count(int[] a) {  
    int n = a.length;  
    int cnt = 0;  
    for (int i = 0; i < n; i++) {  
        for (int j = i+1; j < n; j++) {  
            for (int k = j+1; k < n; k++) {  
                if (a[i] + a[j] + a[k] == 0) {  
                    cnt++;  
                }  
            }  
        }  
    }  
    return cnt;  
}
```

- Why is it correct to start the j loop from i+1?
 - Would we miss a triple if we do so?
 - Is it correct to start the j loop from 0?

ThreeSum: brute-force, 3-loop solution

```
public static int count(int[] a) {  
    int n = a.length;  
    int cnt = 0;  
    for (int i = 0; i < n; i++) {  
        for (int j = i+1; j < n; j++) {  
            for (int k = j+1; k < n; k++) {  
                if (a[i] + a[j] + a[k] == 0) {  
                    cnt++;  
                }  
            }  
        }  
    }  
    return cnt;  
}
```

Would that solution be correct if the input integers are not distinct?

Mathematically modelling runtime

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What is the runtime?

A technique for modeling runtime of algorithms

- $\sum_{all\ statements} Cost * frequency$
- Split the algorithm into blocks such that
 - the code statements in each block have the same frequency
- $\sum_{all\ blocks} Cost * frequency$

Algorithm Analysis Example 1

for ($\overset{1}{i = 0}$; $\overset{n+1}{i < n}$; $\overset{n}{i++}$)
 $a[i] = i;$

Algorithm Analysis Example 2

1

```
if( x > 0 ) {  
    for( i = 0; i < n; i++ )  
        a[i] = i;  
}
```

0 or 1

0 or n

2

Algorithm Analysis Example 3

1

for ($i = n$; $i \geq 1$; $i = i/2$)
 $a[i] = i$; $\log n$

What is the runtime of ThreeSum?

```
public static int count(int[] a) {
```

```
    int n = a.length;
```

```
    int cnt = 0;
```

```
    for (int i = 0; i < n; i++) {
```

```
        for (int j = i+1; j < n; j++) {
```

```
            for (int k = j+1; k < n; k++) {
```

```
                if (a[i] + a[j] + a[k] == 0) {
```

```
                    cnt++;
```

```
                }
```

```
            }
```

```
        }
```

frequency: $f_0 = 1$
cost: t_0

freq: $f_1 = n$
cost: t_1

$f_4 = x$ (the number of triples that sum to 0 in the input array)

$$0 \leq x \leq C(n, 3)$$

cost: t_4

$$(n-3)!6$$

$$6$$

$$6$$

$$2$$

$$+ \frac{n}{3}$$

cost: t_3

What is the runtime of ThreeSum?

frequency: $f_0 = 1$
cost: t_0

freq: $f_1 = n$
cost: t_1

$$\begin{aligned} f_2 &= (n-1) + (n-2) + (n-3) + \dots + 1 \\ &= \frac{n-1}{2} (n-1+1) = \frac{n^2}{2} - \frac{n}{2} \\ \text{cost} &= t_2 \end{aligned}$$

$f_4 = x$ (the number of triples that sum to 0 in the input array)
 $0 \leq x \leq C(n, 3)$
cost: t_4

$$\begin{aligned} f_3 &= C(n, 3) = n_{C_3} = \frac{n!}{(n-3)!3!} \\ &= \frac{n(n-1)(n-2)(n-3)!}{(n-3)!6} = \frac{n(n-1)(n-2)}{6} = \frac{n^3}{6} - \frac{n^2}{2} + \frac{n}{3} \\ \text{cost: } &t_3 \end{aligned}$$

$$\text{Grand total} = \sum_{i=0}^4 f_i * t_i$$

$$= \frac{t_3}{6} n^3 + \left(\frac{t_2}{2} - \frac{t_3}{2} \right) n^2 + \left(\frac{t_3}{3} - \frac{t_2}{2} + t_1 \right) n + t_0 + t_4 x$$

What is the runtime of ThreeSum?

$$\frac{t_3}{6}n^3 + \left(\frac{t_2}{2} - \frac{t_3}{2}\right)n^2 + \left(\frac{t_3}{3} - \frac{t_2}{2} + t_1\right)n + t_0 + t_4x$$

- Remember that $0 \leq x \leq C(n, 3)$
- If $x = 0 \rightarrow$ best-case runtime

$$\frac{t_3}{6}n^3 + \left(\frac{t_2}{2} - \frac{t_3}{2}\right)n^2 + \left(\frac{t_3}{3} - \frac{t_2}{2} + t_1\right)n + t_0$$

- If $x = C(n, 3) \rightarrow$ worst-case runtime

$$\frac{t_3}{6}n^3 + \left(\frac{t_2}{2} - \frac{t_3}{2}\right)n^2 + \left(\frac{t_3}{3} - \frac{t_2}{2} + t_1\right)n + t_0 + t_4\left(\frac{n^3}{6} - \frac{n^2}{2} + \frac{n}{3}\right)$$